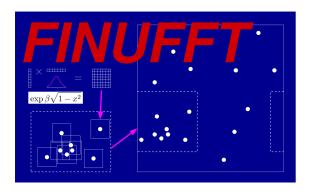
# finufft Documentation

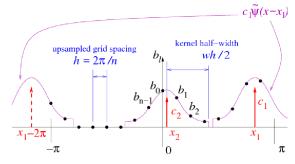
Release 1.0

**Alex Barnett and Jeremy Magland** 

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FINUFFT is a set of libraries to compute efficiently three types of nonuniform fast Fourier transform (NUFFT) to a specified precision, in one, two, or three dimensions, on a multi-core shared-memory machine. The library has a very simple interface, does not need any precomputation step, is written in C++ (using OpenMP and FFTW), and has wrappers to C, fortran, MATLAB, octave, and python. As an example, given M arbitrary real numbers  $x_j$  and complex numbers  $c_j$ , with  $j=1,\ldots,M$ , and a requested integer number of modes N, the 1D type-1 (aka "adjoint") transform evaluates the N numbers

$$f_k = \sum_{j=1}^{M} c_j e^{ikx_j}$$
, for  $k \in \mathbb{Z}$ ,  $-N/2 \le k \le N/2 - 1$ . (1)

The  $x_j$  can be interpreted as nonuniform source locations,  $c_j$  as source strengths, and  $f_k$  then as the kth Fourier series coefficient of the distribution  $f(x) = \sum_{j=1}^M c_j \delta(x-x_j)$ . Such exponential sums are needed in many applications in science and engineering, including signal processing, imaging, diffraction, and numerical partial differential equations. The naive CPU effort to evaluate (1) is O(NM). The library approximates (1) to a requested relative precision  $\epsilon$  with nearly linear effort  $O(M \log(1/\epsilon) + N \log N)$ . Thus the speedup over the naive cost is similar to that achieved by the FFT. This is achieved by spreading onto a regular grid using a carefully chosen kernel, followed by an upsampled FFT, then a division (deconvolution) step. For the 2D and 3D definitions, and other types of transform, see below.

The FINUFFT library achieves its speed via several innovations including:

- 1. The use of a new spreading kernel that is provably close to optimal, yet faster to evaluate than the Kaiser-Bessel kernel
- 2. Quadrature approximation for the Fourier transform of the spreading kernel
- 3. Load-balanced multithreading of the type-1 spreading operation

For the same accuracy in 3D, the library is 3-50 times faster on a single core than the single-threaded fast Gaussian gridding CMCL libraries of Greengard-Lee, and in the multi-core setting for spreading-dominated problems is faster than the Chemnitz NFFT3 library even when the latter is allowed a RAM-intensive full precomputation of the kernel. This is especially true for highly non-uniform point distributions and/or high precision. Our library does not require precomputation, and uses minimal RAM.

For the case of small problems where repeated NUFFTs are needed with a fixed set of nonuniform points, we have started to build advanced interfaces for this case. These are a factor of 2 or more faster than repeated calls to the plain interface, since certain costs such as FFTW setup and sorting are performed only once.

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**Note:** For very small repeated problems (less than 10000 input and output points), users should also consider a dense matrix-matrix multiplication against the NUDFT matrix using BLAS3 (eg ZGEMM). Since we did not want BLAS to be a dependency, we have not yet included this option.

2 CONTENTS

**CHAPTER** 

ONE

#### INSTALLATION

# **Obtaining FINUFFT**

Go to the github page https://github.com/ahbarnett/finufft and follow instructions (eg see the green button).

# **Dependencies**

This library is currently supported for unix/linux and also tested on Mac OSX. We have heard that it can be compiled on Windows too.

For the basic libraries

- C++ compiler, such as g++ packaged with GCC
- FFTW3
- GNU make

#### Optional:

- numdiff (preferred but not essential; enables pass-fail math validation)
- for Fortran wrappers: compiler such as gfortran
- for matlab/octave wrappers: MATLAB, or octave and its development libraries
- for building new matlab/octave wrappers (experts only): mwrap
- for the python wrappers you will need python and pip (if you prefer python v2), or python3 and pip3 (for python v3). You will also need pybind11

# Tips for installing dependencies on various operating systems

On a Fedora/CentOS linux system, these dependencies can be installed as follows:

sudo yum install make gcc gcc-c++ gcc-gfortran fftw3 fftw3-devel libgomp octave octave-devel

then see below for numdiff and mwrap.

**Note:** we are not exactly sure how to install python3 and pip3 using yum

then download the latest numdiff from http://gnu.mirrors.pair.com/savannah/savannah/numdiff/ and set it up via ./configure; make; sudo make install

On Ubuntu linux (assuming python3 as opposed to python):

sudo apt-get install make build-essential libfftw3-dev gfortran numdiff python3 python3-pip octave 1

On Mac OSX:

Make sure you have make installed, eg via XCode.

Install gcc, for instance using pre-compiled binaries from http://hpc.sourceforge.net/

Install homebrew from http://brew.sh:

brew install fftw

Install numdiff as below.

(Note: we are not exactly sure how to install python3 and pip3 on mac)

Currently in Mac OSX, make lib fails to make the shared object library (.so); however the static (.a) library is of reasonable size and works fine.

#### Installing numdiff

numdiff by Ivano Primi extends diff to assess errors in floating-point outputs. Download the latest numdiff from the above URL, un-tar the package, cd into it, then build via ./configure; make; sudo make install

#### **Installing MWrap**

This is not needed for most users. MWrap is a very useful MEX interface generator by Dave Bindel. Make sure you have flex and bison installed. Download version 0.33 or later from http://www.cs.cornell.edu/~bindel/sw/mwrap, un-tar the package, cd into it, then:

make
sudo cp mwrap /usr/local/bin/

# Compilation

We first describe compilation for default options (double precision, openmp) via GCC. If you have a nonstandard unix environment (eg a Mac) or want to change the compiler, then place your compiler and linking options in a new file make.inc. For example such files see make.inc.\*. See makefile for what can be overridden.

Compile and do a rapid (less than 1-second) test of FINUFFT via:

make test

This should compile the main libraries then run tests which should report zero crashes and zero fails. (If numdiff was not installed, it instead produces output that you will have to check by eye matches the requested accuracy.)

Use make perftest for larger spreader and NUFFT tests taking 15-30 seconds.

Run make without arguments for full list of possible make tasks.

Note that the library includes the C and fortran interfaces defined in src/finufft\_c.h and fortran/finufft\_f.h respectively. If there is an error in testing on a standard set-up, please file a bug report as a New Issue at https://github.com/ahbarnett/finufft/issues

## **Custom library compilation options**

You may want to make the library for other data types. Currently library names are distinct for single precision (libfinufft) vs double (libfinufft). However, single-threaded vs multithreaded are built with the same name, so you will have to move them to other locations, or build a 2nd copy of the repo, if you want to keep both versions.

You must do at least make objclean before changing precision or openmp options.

**Single precision**: append PREC=SINGLE to the make task. Single-precision saves half the RAM, and increases speed slightly (<20%). The C++, C, and fortran demos are all tested in single precision. However, it will break matlab, octave, python interfaces.

**Single-threaded**: append OMP=OFF to the make task.

## **Building examples and wrappers**

make examples to compile and run the examples for calling from C++ and from C.

The examples and test directories are good places to see usage examples.

make fortran to compile and run the fortran wrappers and examples.

make matlab to build the MEX interface to matlab.

make octave to build the MEX-like interface to octave.

On Mac OSX, we have found that the MATLAB MEX settings need to be overridden: edit the file mex\_C++\_maci64.xml in the MATLAB distro, to read, for instance:

```
CC="gcc-8"
CXX="g++-8"
CFLAGS="-ansi -D_GNU_SOURCE -fexceptions -fPIC -fno-omit-frame-pointer -pthread"
CXXFLAGS="-ansi -D_GNU_SOURCE -fPIC -fno-omit-frame-pointer -pthread"
```

These settings are copied from the glnxa64 case. Here you will want to replace the compilers by whatever version of GCC you have installed. For pre-2016 MATLAB Mac OSX versions you'll instead want to edit the maci64 section of mexopts.sh.

# **Building the python wrappers**

First make sure you have python3 and pip3 (or python and pip) installed and that you have already compiled the C++ library (eg via make lib). Python links to this compiled library. Next make sure you have NumPy and pybind11 installed:

```
pip3 install numpy pybind11
```

You may then do make python3 which calls pip3 for the install then runs some tests. An additional test you could do is:

```
python3 run_speed_tests.py
```

In all the above the "3" can be omitted if you want to work with python v2.

See also Dan Foreman-Mackey's earlier repo that also wraps finufft, and from which we have drawn code: python-finufft

# A few words about python environments

There can be confusion and conflicts between various versions of python and installed packages. It is therefore a very good idea to use virtual environments. Here's a simple way to do it (after installing python-virtualenv):

```
Open a terminal virtualenv -p /usr/bin/python3 env1 . env1/bin/activate
```

Now you are in a virtual environment that starts from scratch. All pip installed packages will go inside the env1 directory. (You can get out of the environment by typing deactivate)

#### MATHEMATICAL DEFINITIONS OF TRANSFORMS

We use notation with a general space dimensionality d, which will be 1, 2, or 3, in our library. The arbitrary (ie nonuniform) points in space are denoted  $\mathbf{x}_j \in \mathbb{R}^d$ ,  $j=1,\ldots,M$ . We will see that for type-1 and type-2, without loss of generality one could restrict to the periodic box  $[-\pi,\pi)^d$ . For type-1 and type-3, each such NU point carries a given associated strength  $c_j \in \mathbb{C}$ . Type-1 and type-2 involve the Fourier "modes" (Fourier series coefficients) with integer indices lying in the set

$$K = K_{N_1, \dots, N_d} := K_{N_1} K_{N_2} \dots K_{N_d}$$

where

$$K_{N_i} := \begin{cases} \{-N_i/2, \dots, N_i/2 - 1\}, & N_i \text{ even,} \\ \{-(N_i - 1)/2, \dots, (N_i - 1)/2\}, & N_i \text{ odd.} \end{cases}$$

For instance,  $K_{10} = \{-5, -4, \dots, 4\}$ , whereas  $K_{11} = \{-5, -4, \dots, 5\}$ . Thus, in the 1D case K is an interval containing  $N_1$  integer indices, in 2D it is a rectangle of  $N_1N_2$  index pairs, and in 3D it is a cuboid of  $N_1N_2N_3$  index triplets.

Then the type-1 (nonuniform to uniform, aka "adjoint") NUFFT evaluates

$$f_{\mathbf{k}} := \sum_{j=1}^{M} c_j e^{\pm i \mathbf{k} \cdot \mathbf{x}_j} \quad \text{for } \mathbf{k} \in K$$
 (2.1)

This can be viewed as evaluating a set of Fourier series coefficients due to sources with strengths  $c_j$  at the arbitrary locations  $\mathbf{x}_j$ . Either sign of the imaginary unit in the exponential can be chosen in the interface. Note that our normalization differs from that of references [DR,GL].

The type-2 (U to NU, aka "forward") NUFFT evaluates

$$c_j := \sum_{\mathbf{k} \in K} f_{\mathbf{k}} e^{\pm i\mathbf{k} \cdot \mathbf{x}_j} \qquad \text{for } j = 1, \dots, M$$
 (2.2)

This is the adjoint of the type-1, ie the evaluation of a given Fourier series at a set of arbitrary points. Both type-1 and type-2 transforms are invariant under translations of the NU points by multiples of  $2\pi$ , thus one could require that all NU points live in the origin-centered box  $[-\pi,\pi)^d$ . In fact, as a compromise between library speed, and flexibility for the user (for instance, to avoid boundary points being flagged as outside of this box due to round-off error), our library only requires that the NU points lie in the three-times-bigger box  $\mathbf{x}_j \in [-3\pi, 3\pi]^d$ . This allows the user to choose a convenient periodic domain that does not touch this three-times-bigger box. However, there may be a slight speed increase if most points fall in  $[-\pi,\pi)^d$ .

Finally, the type-3 (NU to NU) transform does not have restrictions on the NU points, and there is no periodicity. Let  $\mathbf{x}_j \in \mathbb{R}^d$ ,  $j=1,\ldots,M$ , be NU locations, with strengths  $c_j \in \mathbb{C}$ , and let  $\mathbf{s}_k$ ,  $k=1,\ldots,N$  be NU frequencies. Then the type-3 transform evaluates:

$$f_{\mathbf{k}} := \sum_{j=1}^{M} c_j e^{\pm i \mathbf{s}_k \cdot \mathbf{x}_j}$$
 for  $k = 1, \dots, N$  (2.3)

For all three transforms, the computational effort scales like the product of the space-bandwidth products (real-space width times frequency-space width) in each dimension. For type-1 and type-2 this means near-linear scaling in the total number of modes  $N:=N_1\dots N_d$ . However, be warned that for type-3 this means that, even if N and M are small, if the product of the tightest intervals enclosing the coordinates of  $\mathbf{x}_j$  and  $\mathbf{s}_k$  is large, the algorithm will be inefficient. For such NU points, a direct sum should be used instead.

We emphasise that the NUFFT tasks that this library performs should not be confused with either the discrete Fourier transform (DFT), the (continuous) Fourier transform (although it may be used to approximate this via a quadrature rule), or the inverse NUFFT (the iterative solution of the linear system arising from nonuniform Fourier sampling, as in, eg, MRI). It is also important to know that, for NU points, *the type-1 is not the inverse of the type-2*. See the references for clarification.

## THREE

## CONTENTS OF THE PACKAGE

- finufft-manual.pdf: the manual (auto-generated by sphinx)
- docs : source files for documentation (.rst files are human-readable)
- README .md : github-facing (and human text-reader) doc info
- LICENSE: how you may use this software
- CHANGELOG: list of changes, release notes
- TODO: list of things needed to fix or extend (hackers please help)
- makefile: GNU makefile (there are no makefiles in subdirectories)
- src: main library source and headers. Compiled objects will be built here
- lib: dynamic library will be built here
- lib-static: static library will be built here
- test: validation and performance tests, bash scripts driving compiled C++
  - test/check\_finufft.sh is the main pass-fail validation bash script
  - test/nuffttestnd.sh is a simple uniform-point performance test bash script
  - test/results: validation comparison outputs (\*.refout; do not remove these), and local test and performance outputs (\*.out; you may remove these)
- examples: simple example codes for calling the library from C++ and C
- fortran: wrappers and drivers for Fortran (see fortran/README)
- matlab: wrappers and examples for MATLAB/octave
- finufftpy: python wrappers
- python\_tests: accuracy and speed tests and examples using the python wrappers
- setup.py: needed so pip or pip3 can build and install the python wrappers
- contrib: 3rd-party code

**CHAPTER** 

**FOUR** 

## **USAGE AND INTERFACES**

Here we describe calling FINUFFT from C++, C, and Fortran.

We provide Type 1 (nonuniform to uniform), Type 2 (uniform to nonuniform), and Type 3 (nonuniform to nonuniform), in dimensions 1, 2, and 3. This gives nine basic routines. There are also two *advanced interfaces* for multiple 2d1 and 2d2 transforms with the same point locations.

Using the library is a matter of filling your input arrays, allocating the correct output array size, possibly setting fields in the options struct, then calling one of the transform routines below.

## Interfaces from C++

We first give a simple example of performing a 1D type-1 transform in double precision from C++, the library's native language, using C++ complex number type. First include the headers:

```
#include "finufft.h"
#include <complex>
using namespace std;
```

Now in the body of the code, assuming M has been set to be the number of nonuniform points, we allocate the input arrays:

```
double *x = (double *)malloc(sizeof(double)*M);
complex<double>* c = (complex<double>*)malloc(sizeof(complex<double>)*M);
```

These arrays should now be filled with the user's data: values in x should lie in  $[-3\pi, 3\pi]$ , and c can be arbitrary complex strengths (we omit example code for this here). With N as the number of modes, allocate the output array:

```
complex<double>* F = (complex<double>*) malloc(sizeof(complex<double>) *N);
```

Before usage, set default values in the options struct opts:

```
nufft_opts opts; finufft_default_opts(opts);
```

Warning: if this is not called, options may take on random values which may cause a crash. To perform the nonuniform FFT is then one line:

```
int ier = finufft1d1(M,x,c,+1,1e-6,N,F,opts);
```

This fills F with the output modes, in increasing ordering from -N/2 to N/2-1. Here +1 sets the sign of i in the exponentials in the *definitions*, 1e-6 chooses 6-digit relative tolerance, and ier is a status output which is zero if successful (see below). See example1d1.cpp, in the examples directory, for a simple full working example. Then to compile, linking to the double-precision static library, use eg:

```
g++ example1d1.cpp -o example1d1 -I FINUFFT/src FINUFFT/lib-static/libfinufft.a -fopenmp
```

where FINUFFT denotes the top-level directory of the installed library. The examples and test directories are good places to see further usage examples. The documentation for all nine routines follows below.

If you have a small-scale 2D task (say less than 10<sup>5</sup> points or modes) with multiple strength or coefficient vectors but fixed nonuniform points, see the *advanced interfaces*.

### **Options**

You may override the default options in opts by changing the fields in this struct, after setting up with default values as above. This allows control of various parameters such as the mode ordering, FFTW plan mode, upsampling factor  $\sigma$ , and debug/timing output. Here is the list of the options fields you may set (see the header src/finufft.h). Here the abbreviation FLT means double if compiled in the default double-precision, or single if single precision:

```
// 0: silent, 1: text basic timing output
int debug;
int spread_debug;
                    // passed to spread_opts, 0 (no text) 1 (some) or 2 (lots)
                    // passed to spread_opts, 0 (don't sort) 1 (do) or 2 (heuristic)
int spread_sort;
int spread_kerevalmeth; // "
                                spread_opts, 0: exp(sqrt()), 1: Horner ppval (faster)
int spread_kerpad; // passed to spread_opts, 0: don't pad to mult of 4, 1: do
int chkbnds;
                    // 0: don't check if input NU pts in [-3pi,3pi], 1: do
                    // 0:FFTW_ESTIMATE, or 1:FFTW_MEASURE (slow plan but faster)
int fftw;
int modeord;
                    // 0: CMCL-style increasing mode ordering (neg to pos), or
                    // 1: FFT-style mode ordering (affects type-1,2 only)
FLT upsampfac;
                    // upsampling ratio sigma, either 2.0 (standard) or 1.25 (small FFT)
```

Here are their default settings (set in src/common.cpp:finufft\_default\_opts):

```
debug = 0;
spread_debug = 0;
spread_sort = 2;
spread_kerevalmeth = 1;
spread_kerpad = 1;
chkbnds = 0;
fftw = FFTW_ESTIMATE;
modeord = 0;
upsampfac = (FLT) 2.0;
```

To get the fastest runtime, we recommend that you experiment firstly with: fftw, upsampfac, and spread\_sort, detailed below. If you are having crashes, set chkbnds=1 to see if illegal x coordinates are being input.

Notes on various options:

spread\_sort: the default setting is spread\_sort=2 which applies the following heuristic rule: in 2D or 3D always sort, but in 1D, only sort if N (number of modes) > M/10 (where M is number of nonuniform pts).

fftw: The default FFTW plan is FFTW\_ESTIMATE; however if you will be making multiple calls, consider fftw=FFTW\_MEASURE, which will spend many seconds planning but give the fastest speed when called again. Note that FFTW plans are saved (by FFTW's library) automatically from call to call in the same executable (incidentally also in the same MATLAB/octave or python session).

upsampfac: This is the internal factor by which the FFT is larger than the number of requested modes in each dimension. We have built efficient kernels for only two settings: upsampfac=2.0 (standard), and upsampfac=1.25 (lower RAM, smaller FFTs, but wider spreading kernel). The latter can be much faster when the number of nonuniform points is similar or smaller to the number of modes, and/or if low accuracy is required. It is especially much faster for type 3 transforms. However, the kernel widths w are about 50% larger in each dimension, which can lead to slower spreading (it can also be faster due to the smaller size of the fine grid). Thus only 9-digit accuracy can currently be reached with upsampfac=1.25.

-lfftw3 thre

#### **Error codes**

In the interfaces, the returned value is 0 if successful, otherwise the error code has the following meanings (see src/utils.h):

```
requested tolerance epsilon too small
attemped to allocate internal arrays larger than MAX_NF (defined in common.h)
spreader: fine grid too small
spreader: if chkbnds=1, a nonuniform point out of input range [-3pi,3pi]^d
spreader: array allocation error
spreader: illegal direction (should be 1 or 2)
upsampfac too small (should be >1)
upsampfac not a value with known Horner eval: currently 2.0 or 1.25 only
ndata not valid (should be >= 1)
```

In the interfaces below, int64 (typedefed as BIGINT in the code) means 64-bit signed integer type, ie int64\_t. This is used for all potentially large integers, in case the user wants large problems involving more than 2^31 points. int is the usual 32-bit signed integer. The FLT type is, as above, either double or single.

```
int finufftld1(int64 nj,double* xj,dcomplex* cj,int iflag,double eps,int64 ms,
             dcomplex* fk, nufft_opts opts)
Type-1 1D complex nonuniform FFT.
             nj-1
             SUM cj[j] \exp(+/-i k1 xj(j)) for -ms/2 \le k1 \le (ms-1)/2
   fk(k1) =
             j=0
Inputs:
         number of sources (int64)
  пj
         location of sources (size-nj FLT array), in [-3pi,3pi]
   χj
         size-nj FLT complex array of source strengths
          (ie, stored as 2*nj FLTs interleaving Re, Im).
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
          precision requested (>1e-16)
          number of Fourier modes computed, may be even or odd (int64);
          in either case the mode range is integers lying in [-ms/2, (ms-1)/2]
        struct controlling options (see finufft.h)
  opts
Outputs:
         size-ms FLT complex array of Fourier transform values
   fk
          stored as alternating Re & Im parts (2*ms FLTs)
          order determined by opts.modeord.
  returned value - 0 if success, else see ../docs/usage.rst
  The type 1 NUFFT proceeds in three main steps (see [GL]):
  1) spread data to oversampled regular mesh using kernel.
   2) compute FFT on uniform mesh
   3) deconvolve by division of each Fourier mode independently by the kernel
      Fourier series coeffs (not merely FFT of kernel), shuffle to output.
Written with FFTW style complex arrays. Step 3a internally uses dcomplex,
 and Step 3b internally uses real arithmetic and FFTW style complex.
Because of the former, compile with -Ofast in GNU.
```

```
int finufft1d2(int64 nj,double* xj,dcomplex* cj,int iflag,double eps,int64 ms,
             dcomplex* fk, nufft_opts opts)
Type-2 1D complex nonuniform FFT.
  cj[j] = SUM \quad fk[k1] \exp(+/-i k1 xj[j]) \quad for j = 0,...,nj-1
  where sum is over -ms/2 \le k1 \le (ms-1)/2.
Inputs:
        number of targets (int64)
  пj
        location of targets (size-nj FLT array), in [-3pi,3pi]
  хj
         complex Fourier transform values (size ms, ordering set by opts.modeord)
         (ie, stored as 2*nj FLTs interleaving Re, Im).
  iflag if >=0, uses + sign in exponential, otherwise - sign (int).
         precision requested (>1e-16)
         number of Fourier modes input, may be even or odd (int64);
         in either case the mode range is integers lying in [-ms/2, (ms-1)/2]
  opts struct controlling options (see finufft.h)
Outputs:
         complex FLT array of nj answers at targets
  Сj
  returned value - 0 if success, else see ../docs/usage.rst
  The type 2 algorithm proceeds in three main steps (see [GL]).
  1) deconvolve (amplify) each Fourier mode, dividing by kernel Fourier coeff
  2) compute inverse FFT on uniform fine grid
  3) spread (dir=2, ie interpolate) data to regular mesh
  The kernel coeffs are precomputed in what is called step 0 in the code.
Written with FFTW style complex arrays. Step 0 internally uses dcomplex,
and Step 1 internally uses real arithmetic and FFTW style complex.
Because of the former, compile with -Ofast in GNU.
int finufft1d3(int64 nj,double* xj,dcomplex* cj,int iflag, double eps,
              int64 nk, double* s, dcomplex* fk, nufft_opts opts)
Type-3 1D complex nonuniform FFT.
            nj-1
  fk[k] = SUM c[j] exp(+-i s[k] xj[j]), for k = 0, ..., nk-1
             j=0
Inputs:
  пj
         number of sources (int64)
  хj
         location of sources on real line (nj-size array of FLT)
  сј
         size-nj FLT complex array of source strengths
          (ie, stored as 2*nj FLTs interleaving Re, Im).
         number of frequency target points (int64)
  nk
         frequency locations of targets in R.
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
        precision requested (>1e-16)
  opts struct controlling options (see finufft.h)
Outputs:
  fk
         size-nk FLT complex Fourier transform values at target
         frequencies sk
  returned value - 0 if success, else see ../docs/usage.rst
```

```
The type 3 algorithm is basically a type 2 (which is implemented precisely as call to type 2) replacing the middle FFT (Step 2) of a type 1. See [LG]. Beyond this, the new twists are:

i) nfl, number of upsampled points for the type-1, depends on the product of interval widths containing input and output points (X*S).

ii) The deconvolve (post-amplify) step is division by the Fourier transform of the scaled kernel, evaluated on the *nonuniform* output frequency grid; this is done by direct approximation of the Fourier integral using quadrature of the kernel function times exponentials.

iii) Shifts in x (real) and s (Fourier) are done to minimize the interval half-widths X and S, hence nfl.
```

```
int finufft2d1(int64 nj,double* xj,double *yj,dcomplex* cj,int iflag,
             double eps, int64 ms, int64 mt, dcomplex* fk, nufft_opts opts)
Type-1 2D complex nonuniform FFT.
                 nj-1
   f[k1, k2] =
                 SUM c[j] \exp(+-i (k1 x[j] + k2 y[j]))
                 i=0
  for -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2.
  The output array is k1 (fast), then k2 (slow), with each dimension
  determined by opts.modeord.
  If iflag>0 the + sign is used, otherwise the - sign is used,
  in the exponential.
Inputs:
         number of sources (int64)
  пj
           x,y locations of sources (each a size-nj FLT array) in [-3pi,3pi]
  xj,yj
          size-nj complex FLT array of source strengths,
          (ie, stored as 2*nj FLTs interleaving Re, Im).
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
         precision requested (>1e-16)
  ms, mt number of Fourier modes requested in x and y (int64);
         each may be even or odd;
          in either case the mode range is integers lying in [-m/2, (m-1)/2]
         struct controlling options (see finufft.h)
  opts
Outputs:
         complex FLT array of Fourier transform values
          (size ms*mt, fast in ms then slow in mt,
          ie Fortran ordering).
  returned value - 0 if success, else see ../docs/usage.rst
  The type 1 NUFFT proceeds in three main steps (see [GL]):
  1) spread data to oversampled regular mesh using kernel.
  2) compute FFT on uniform mesh
  3) deconvolve by division of each Fourier mode independently by the
      Fourier series coefficient of the kernel.
  The kernel coeffs are precomputed in what is called step 0 in the code.
int finufft2d2(int64 nj,double* xj,double *yj,dcomplex* cj,int iflag,double eps,
```

```
int64 ms, int64 mt, dcomplex* fk, nufft_opts opts)
Type-2 2D complex nonuniform FFT.
  cj[j] = SUM
                 fk[k1,k2] exp(+/-i (k1 xj[j] + k2 yj[j])) for j = 0,...,nj-1
          k1, k2
  where sum is over -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
 Inputs:
        number of targets (int64)
  пj
  xj,yj x,y locations of targets (each a size-nj FLT array) in [-3pi,3pi]
         FLT complex array of Fourier transform values (size ms*mt,
         changing fast in ms then slow in mt, as in Fortran)
         Along each dimension the ordering is set by opts.modeord.
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
         precision requested (>1e-16)
  ms, mt numbers of Fourier modes given in x and y (int64)
         each may be even or odd;
         in either case the mode range is integers lying in [-m/2, (m-1)/2].
        struct controlling options (see finufft.h)
  opts
Outputs:
         size-nj complex FLT array of target values
  Сİ
          (ie, stored as 2*nj FLTs interleaving Re, Im).
  returned value - 0 if success, else see ../docs/usage.rst
  The type 2 algorithm proceeds in three main steps (see [GL]).
  1) deconvolve (amplify) each Fourier mode, dividing by kernel Fourier coeff
  2) compute inverse FFT on uniform fine grid
  3) spread (dir=2, ie interpolate) data to regular mesh
  The kernel coeffs are precomputed in what is called step 0 in the code.
int finufft2d3(int64 nj,double* xj,double* yj,dcomplex* cj,int iflag,
   double eps, int64 nk, double* s, double *t, dcomplex* fk, nufft_opts opts)
Type-3 2D complex nonuniform FFT.
            n j-1
  fk[k] = SUM c[j] exp(+-i (s[k] xj[j] + t[k] yj[j]), for k=0,...,nk-1
            j=0
Inputs:
  пj
         number of sources (int64)
  xj,yj x,y location of sources in the plane R^2 (each size-nj FLT array)
         size-nj complex FLT array of source strengths,
          (ie, stored as 2*nj FLTs interleaving Re, Im).
  nk
         number of frequency target points (int64)
         (k_x, k_y) frequency locations of targets in R^2.
  s.t
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
        precision requested (>1e-16)
  opts struct controlling options (see finufft.h)
Outputs:
         size-nk complex FLT Fourier transform values at the
         target frequencies sk
  returned value - 0 if success, else see ../docs/usage.rst
  The type 3 algorithm is basically a type 2 (which is implemented precisely
  as call to type 2) replacing the middle FFT (Step 2) of a type 1. See [LG].
```

```
Beyond this, the new twists are:

i) number of upsampled points for the type-1 in each dim, depends on the product of interval widths containing input and output points (X*S), for that dim.

ii) The deconvolve (post-amplify) step is division by the Fourier transform of the scaled kernel, evaluated on the *nonuniform* output frequency grid; this is done by direct approximation of the Fourier integral using quadrature of the kernel function times exponentials.

iii) Shifts in x (real) and s (Fourier) are done to minimize the interval half-widths X and S, hence nf, in each dim.
```

```
int finufft3d1(int64 nj,double* xj,double *yj,double *zj,dcomplex* cj,int iflag,
             double eps, int64 ms, int64 mt, int64 mu, dcomplex* fk,
             nufft_opts opts)
Type-1 3D complex nonuniform FFT.
                    nj-1
  f[k1, k2, k3] =
                    SUM c[j] \exp(+-i (k1 x[j] + k2 y[j] + k3 z[j]))
                    i=0
      for -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
          -mu/2 \le k3 \le (mu-1)/2.
   The output array is as in opt.modeord in each dimension.
  k1 changes is fastest, k2 middle,
  and k3 slowest, ie Fortran ordering. If iflag>0 the + sign is
  used, otherwise the - sign is used, in the exponential.
Inputs:
  пj
         number of sources (int64)
  xj,yj,zj x,y,z locations of sources (each size-nj FLT array) in [-3pi,3pi]
         size-nj complex FLT array of source strengths,
          (ie, stored as 2*nj FLTs interleaving Re, Im).
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
         precision requested
  ms, mt, mu number of Fourier modes requested in x, y, z (int64);
          each may be even or odd;
          in either case the mode range is integers lying in [-m/2, (m-1)/2]
        struct controlling options (see finufft.h)
  opts
Outputs:
         complex FLT array of Fourier transform values (size ms*mt*mu,
          changing fast in ms to slowest in mu, ie Fortran ordering).
  returned value - 0 if success, else see ../docs/usage.rst
  The type 1 NUFFT proceeds in three main steps (see [GL]):
  1) spread data to oversampled regular mesh using kernel.
  2) compute FFT on uniform mesh
   3) deconvolve by division of each Fourier mode independently by the
      Fourier series coefficient of the kernel.
  The kernel coeffs are precomputed in what is called step 0 in the code.
int finufft3d2(int64 nj,double* xj,double *xj,double *zj,dcomplex* cj,
```

```
int iflag, double eps, int64 ms, int64 mt, int64 mu,
             dcomplex* fk, nufft_opts opts)
Type-2 3D complex nonuniform FFT.
            SUM fk[k1,k2,k3] exp(+/-i (k1 xj[j] + k2 yj[j] + k3 zj[j]))
          k1, k2, k3
   for j = 0, \ldots, nj-1
  where sum is over -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
                     -mu/2 \le k3 \le (mu-1)/2
Inputs:
  пj
         number of targets (int64)
  xj,yj,zj x,y,z locations of targets (each size-nj FLT array) in [-3pi,3pi]
         FLT complex array of Fourier series values (size ms*mt*mu,
          changing fastest in ms to slowest in mu, ie Fortran ordering).
          (ie, stored as alternating Re & Im parts, 2*ms*mt*mu FLTs)
          Along each dimension, opts.modeord sets the ordering.
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
         precision requested
  ms, mt, mu numbers of Fourier modes given in x, y, z (int64);
          each may be even or odd;
          in either case the mode range is integers lying in [-m/2, (m-1)/2].
        struct controlling options (see finufft.h)
Outputs:
          size-nj complex FLT array of target values,
          (ie, stored as 2*nj FLTs interleaving Re, Im).
  returned value - 0 if success, else see ../docs/usage.rst
  The type 2 algorithm proceeds in three main steps (see [GL]).
   1) deconvolve (amplify) each Fourier mode, dividing by kernel Fourier coeff
   2) compute inverse FFT on uniform fine grid
   3) spread (dir=2, ie interpolate) data to regular mesh
  The kernel coeffs are precomputed in what is called step 0 in the code.
int finufft3d3(int64 nj,double* xj,double* yj,double *zj, dcomplex* cj,
             int iflag, double eps, int64 nk, double* s, double *t,
             double *u, dcomplex* fk, nufft_opts opts)
Type-3 3D complex nonuniform FFT.
             nj-1
   fk[k] = SUM c[j] exp(+-i (s[k] xj[j] + t[k] yj[j] + u[k] zj[j]),
             \dot{j} = 0
Inputs:
        number of sources (int64)
   xj,yj,zj x,y,z location of sources in R^3 (each size-nj FLT array)
         size-nj complex FLT array of source strengths
         (ie, interleaving Re & Im parts)
         number of frequency target points (int64)
              (k_x, k_y, k_z) frequency locations of targets in R<sup>3</sup>.
  s,t,u
  iflag if >=0, uses + sign in exponential, otherwise - sign (int)
         precision requested (FLT)
  opts
        struct controlling options (see finufft.h)
Outputs:
```

```
size-nk complex FLT array of Fourier transform values at the
       target frequencies sk
returned value - 0 if success, else see ../docs/usage.rst
                     for k=0, \ldots, nk-1
The type 3 algorithm is basically a type 2 (which is implemented precisely
as call to type 2) replacing the middle FFT (Step 2) of a type 1. See [LG].
Beyond this, the new twists are:
i) number of upsampled points for the type-1 in each dim, depends on the
 product of interval widths containing input and output points (X*S), for
 that dim.
ii) The deconvolve (post-amplify) step is division by the Fourier transform
 of the scaled kernel, evaluated on the *nonuniform* output frequency
 grid; this is done by direct approximation of the Fourier integral
 using quadrature of the kernel function times exponentials.
iii) Shifts in x (real) and s (Fourier) are done to minimize the interval
 half-widths X and S, hence nf, in each dim.
```

## Interfaces from C

The C user should initialize the options struct via:

```
nufft_c_opts opts; finufft_default_c_opts(opts);
```

Options fields may then be changed in opts before passing to the following interfaces. We use the C99 complex type \_Complex, which is the same as complex. As above, FLT indicates double or float. The meaning of arguments are identical to the C++ documentation above. For a demo see examples/example1d1c.c:

```
int finufftldl_c(int nj,FLT* xj,FLT _Complex* cj,int iflag, FLT eps,int ms, FLT _Complex* fk, nufft_dint finufftld2_c(int nj,FLT* xj,FLT _Complex* cj,int iflag,FLT eps,int ms, FLT _Complex* fk, nufft_dint finufftld3_c(int j,FLT* x,FLT _Complex* c,int iflag,FLT eps,int nk, FLT* s, FLT _Complex* f, nuffinufftld1_c(int nj,FLT* xj,FLT *yj,FLT _Complex* cj,int iflag,FLT eps,int ms, int finufftld1_c(int ndata,int nj,FLT* xj,FLT *yj,FLT _Complex* cj,int iflag,FLT eps,int ms, int finufftld2_c(int nj,FLT* xj,FLT *yj,FLT _Complex* cj,int iflag,FLT eps,int ms, int finufftld3_c(int ndata,int nj,FLT* xj,FLT *yj,FLT _Complex* cj,int iflag,FLT eps,int ms, int finufftld1_c(int nj,FLT* xj,FLT* yj,FLT _Complex* cj,int iflag,FLT eps,int ms, int finufftld1_c(int nj,FLT* xj,FLT* yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* xj,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* xj,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* xj,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *yj,FLT *zj,FLT _Complex* cj,int iflag,FLT eps,int ms, int mt, int finufftld2_c(int nj,FLT* x,FLT *
```

#### Interfaces from fortran

We have not yet included control of the options in the fortran wrappers. Please help create these if you can. The meaning of arguments is as in the C++ documentation above, apart from that now ier is an argument which is output to. Examples of calling all 9 routines from fortran are in fortran/nufft?d\_demo.f (for double-precision) and fortran/nufft?d\_demof.f (single-precision). Here are the calling commands with fortran types for the default double-precision case:

```
integer ier,iflag,ms,mt,mu,nj,ndata
real*8, allocatable :: xj(:),yj(:),zj(:), sk(:),tk(:),uk(:)
real*8 err,eps
complex*16, allocatable :: cj(:), fk(:)
```

4.2. Interfaces from C

```
call finufftld1_f(nj,xj,cj,iflag,eps, ms,fk,ier)
call finufftld2_f(nj,xj,cj,iflag, eps, ms,fk,ier)
call finufftld3_f(nj,xj,cj,iflag,eps, ms,sk,fk,ier)
call finufft2d1_f(nj,xj,yj,cj,iflag,eps,ms,mt,fk,ier)
call finufft2d1many_f(ndata,nj,xj,yj,cj,iflag,eps,ms,mt,fk,ier)
call finufft2d2_f(nj,xj,yj,cj,iflag,eps,ms,mt,fk,ier)
call finufft2d2many_f(ndata,nj,xj,yj,cj,iflag,eps,ms,mt,fk,ier)
call finufft2d3_f(nj,xj,yj,cj,iflag,eps,nk,sk,tk,fk,ier)
call finufft3d1_f(nj,xj,yj,zj,cj,iflag,eps,ms,mt,mu,fk,ier)
call finufft3d2_f(nj,xj,yj,zj,cj,iflag,eps,ms,mt,mu,fk,ier)
call finufft3d3_f(nj,xj,yj,zj,cj,iflag,eps,nk,sk,tk,uk,fk,ier)
```

# Design notes and data types

We strongly recommend you use upsampfac=1.25 for type-3; it reduces its run-time from around 8 times the types 1 or 2, to around 3-4 times. It is often also faster for type-1 and type-2, at low precisions.

When you include the header finufft.h you have access to the BIGINT type which is used for all potentially-large input integers (M, N, etc), and currently typedefed to int64\_t (see utils.h). This allows the number of sources, number of modes, etc, to safely exceed 2^31 (around 2e9). In case you were to want to change this type, you may want to use BIGINT in your calling codes. Using int64\_t will be fine if you don't change this. To change (perhaps for speed, but we have not noticed any speed hit using 64-bit integers throughout), one would change BIGINT from int64\_t to int in utils.h.

Sizes >= 2^31 have been tested for C++ drivers (test/finufft?d\_test.cpp), and work fine, if you have enough RAM.

In fortran and C the interface is still 32-bit integers, limiting to array sizes <2^31.

C++ is used for all main libraries, almost entirely avoiding object-oriented code. C++ std::complex<double> (aliased to dcomplex) and FFTW complex types are mixed within the library, since to some extent it is a glorified driver for FFTW. The interfaces are dcomplex. FFTW was considered universal and essential enough to be a dependency for the whole package.

There is a hard-defined limit of 1e11 for internal FFT arrays, set in common.h as MAX\_NF: if your machine has RAM of order 1TB, and you need it, set this larger and recompile. The point of this is to catch ridiculous-sized mallocs and exit gracefully. Note that mallocs smaller than this, but which still exceed available RAM, cause segfaults as usual. For simplicity of code, we do not do error checking on every malloc.

As a spreading kernel function, we use a new faster simplification of the Kaiser–Bessel kernel. At high requested precisions, like the Kaiser–Bessel, this achieves roughly half the kernel width achievable by a truncated Gaussian. Our kernel is  $\exp(-\text{beta.sqrt}(1-(2x/W)^2))$ , where W = nspread is the full kernel width in grid units. This (and Kaiser–Bessel) are good approximations to the prolate spheroidal wavefunction of order zero (PSWF), being the functions of given support [-W/2,W/2] whose Fourier transform has minimal L2 norm outside of a symmetric interval. The PSWF frequency parameter (see [ORZ]) is c = pi.(1-1/2sigma).W where sigma is the upsampling parameter. See our forthcoming paper.

# ADVANCED INTERFACES FOR MANY VECTORS WITH SAME NONUNIFORM POINTS

It is common to need repeated NUFFTs with a fixed set of nonuniform points, but different strength or mode coefficient vectors. For large problems, performing sequential plain calls is efficient (although there would be a slight benefit to sorting only once), but when the problem size is smaller, certain start-up costs cause repeated calls to the plain interface to be slower than necessary. In particular, we note that FFTW takes around 0.1 ms per thread to look up stored wisdom, which for small problems (of order 10000 or less input and output data) can, sadly, dominate the runtime. Thus we include interfaces, described here, for multiple stacked strength or coefficient vectors with the same nonuniform points.

These have only been implemented for the 2d1 and 2d2 types so far, for which there are applications in cryo-EM.

```
int finufft2dlmany(int ndata, BIGINT nj, FLT* xj, FLT *yj, CPX* c, int iflag,
                   FLT eps, BIGINT ms, BIGINT mt, CPX* fk, nufft_opts opts)
Type-1 2D complex nonuniform FFT for multiple strength vectors, same NU pts.
                  ηj
 f[k1, k2, d] =
                 SUM c[j,d] \exp(+-i (k1 x[j] + k2 y[j]))
                 j=1
 for -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2, d = 0, ..., ndata-1
 The output array is in increasing k1 ordering (fast), then increasing
 k2 ordering (slow), then increasing d (slowest). If iflag>0 the + sign
 is used, otherwise the - sign is used, in the exponential.
Inputs:
 ndata number of data
        number of sources (int64)
 xj,yj x,y locations of sources (each a size-nj FLT array) in [-3pi,3pi]
        a size nj*ndata complex FLT array of source strengths,
        increasing fast in nj then slow in ndata.
 iflag if >=0, uses + sign in exponential, otherwise - sign.
        precision requested (>1e-16)
 ms, mt number of Fourier modes requested in x and y; each may be even or odd;
         in either case the mode range is integers lying in [-m/2, (m-1)/2].
        ms*mt must not exceed 2^31.
  opts struct controlling options (see finufft.h)
Outputs:
 fk
         complex FLT array of Fourier transform values
         (size ms*mt*ndata, increasing fast in ms then slow in mt then in ndata
         ie Fortran ordering).
```

```
returned value - 0 if success, else see ../docs/usage.rst
 Note: nthreads times the RAM is needed, so this is good only for small problems.
int finufft2d2many(int ndata, BIGINT nj, FLT* xj, FLT *yj, CPX* c, int iflag,
                   FLT eps, BIGINT ms, BIGINT mt, CPX* fk, nufft_opts opts)
Type-2 2D complex nonuniform FFT for multiple coeff vectors, same NU pts.
 ci[i,d] = SUM
                  fk[k1,k2,d] exp(+/-i (k1 xj[j] + k2 yj[j]))
           k1,k2
 for j = 0, ..., nj-1, d = 0, ..., ndata-1
 where sum is over -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2
Inputs:
 ndata number of mode coefficient vectors
        number of targets (int64)
 xj,yj x,y locations of targets (each a size-nj FLT array) in [-3pi,3pi]
        FLT complex array of Fourier transform values (size ms*mt*ndata,
        increasing fast in ms then slow in mt then in ndata, ie Fortran
        ordering). Along each dimension the ordering is set by opts.modeord.
 iflag if >=0, uses + sign in exponential, otherwise - sign (int)
        precision requested (>1e-16)
 ms, mt numbers of Fourier modes given in x and y
        each may be even or odd;
        in either case the mode range is integers lying in [-m/2, (m-1)/2].
        ms*mt must not exceed 2^31.
 opts
        struct controlling options (see finufft.h)
Outputs:
         size-nj*ndata complex FLT array of target values, (ie, stored as
 сј
         2*nj*ndata FLTs interleaving Re, Im), increasing fast in nj then
         slow in ndata.
 returned value - 0 if success, else see ../docs/usage.rst
 Note: nthreads times the RAM is needed, so this is good only for small problems.
```

# **Design notes**

After extensive timing tests, we settled on blocking up the ndata vectors into blocks of size nthreads (the available thread number). Each block is handled together via FFTW and OpenMP parallelism. For instance, for type-1:

- 1. Each thread calls a single-threaded spreader, reusing a precomputed sorted index list.
- 2. Apply FFT on nthreads vectors of data using FFTW's "many dft" interface.
- 3. Each thread calls a single-threaded deconvolve function.

This requires ndata times the RAM overhead than the plain interface.

It would also be possible to call multi-threaded spreading, sequentially on each data vector; we found this slower in all cases, and so close to repeated calls to the plain interface as to not be useful.

For repeated small problems where the nonuniform points and strengths or coefficients change, but the mode grid is fixed, reusing the FFTW plan may still be beneficial; this would require a three-call "plan, execute, destroy" interface which we have not considered worth building yet.

## MATLAB/OCTAVE INTERFACES

```
FINUFFT1D1
[f ier] = finufft1d1(x,c,isign,eps,ms)
[f ier] = finufft1d1(x,c,isign,eps,ms,opts)
Type-1 1D complex nonuniform FFT.
             пj
    f(k1) = SUM c[j] exp(+/-i k1 x(j)) for -ms/2 <= k1 <= (ms-1)/2
  Inputs:
          location of sources on interval [-3pi,3pi], length nj
    Х
          size-nj complex array of source strengths
    isign if >=0, uses + sign in exponential, otherwise - sign.
           precision requested (>1e-16)
    ms
           number of Fourier modes computed, may be even or odd;
           in either case the mode range is integers lying in [-ms/2, (ms-1)/2]
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
  Outputs:
    f
         size-ms double complex array of Fourier transform values
    ier - 0 if success, else:
         1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
          other codes: as returned by cnufftspread
FINUFFT1D2
[c ier] = finufft1d2(x,isign,eps,f)
[c ier] = finufft1d2(x,isign,eps,f,opts)
Type-2 1D complex nonuniform FFT.
   c[j] = SUM
              f[k1] \exp(+/-i k1 x[j]) for j = 1,...,nj
    where sum is over -ms/2 \le k1 \le (ms-1)/2.
 Inputs:
          location of NU targets on interval [-3pi,3pi], length nj
```

```
complex Fourier transform values
    isign if >=0, uses + sign in exponential, otherwise - sign.
    eps precision requested (>1e-16)
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
 Outputs:
         complex double array of nj answers at targets
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
          other codes: as returned by cnufftspread
c = complex(zeros(nj,1)); % todo: change all output to inout & prealloc...
FINUFFT1D3
[f ier] = finufft1d3(x,c,isign,eps,s)
[f ier] = finufft1d3(x,c,isign,eps,s,opts)
            пj
    f[k] = SUM c[j] exp(+-i s[k] x[j]), for k = 1, ..., nk
            j=1
  Inputs:
          location of NU sources in R (real line).
   Х
         size-nj double complex array of source strengths
         frequency locations of NU targets in R.
    isign if >=0, uses + sign in exponential, otherwise - sign.
        precision requested (>1e-16)
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
  Outputs:
         size-nk double complex Fourier transform values at target
          frequencies s
    returned value - 0 if success, else:
                    1 : eps too small
                    2 : size of arrays to malloc exceed MAX_NF
FINUFFT2D1
[f ier] = finufft2d1(x,y,c,isign,eps,ms,mt)
[f ier] = finufft2d1(x,y,c,isign,eps,ms,mt,opts)
Type-1 2D complex nonuniform FFT.
                 пj
    f[k1, k2] = SUM c[j] exp(+-i (k1 x[j] + k2 y[j]))
                j=1
    for -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2.
  Inputs:
```

```
x,y locations of NU sources on the square [-3pi,3pi]^2, each length nj
         size-nj complex array of source strengths
    isign if >=0, uses + sign in exponential, otherwise - sign.
           precision requested (>1e-16)
    ms,mt number of Fourier modes requested in x & y; each may be even or odd
         in either case the mode range is integers lying in [-m/2, (m-1)/2]
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
  Outputs:
    f
          size (ms*mt) double complex array of Fourier transform values
          (ordering given by opts.modeord in each dimension, ms fast, mt slow)
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
         other codes: as returned by cnufftspread
FINUFFT2D1MANY
[f ier] = finufft2d1many(x,y,c,isign,eps,ms,mt)
[f ier] = finufft2d1many(x,y,c,isign,eps,ms,mt,opts)
Type-1 2D complex nonuniform FFT
                   пj
    f[k1, k2, d] = SUM c[j, d] exp(+-i (k1 x[j] + k2 y[j]))
                   j=1
    for -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2, d = 1, ..., ndata
  Inputs:
        locations of NU sources on the square [-3pi,3pi]^2, each length nj
         size-(nj,ndata) complex array of source strengths
    isign if >=0, uses + sign in exponential, otherwise - sign.
          precision requested (>1e-16)
    ms,mt number of Fourier modes requested in x & y; each may be even or odd
          in either case the mode range is integers lying in [-m/2, (m-1)/2]
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
  Outputs:
    f
         size (ms, mt, ndata) double complex array of Fourier transform values
         (ordering given by opts.modeord in each dimension, ms fast, mt slow)
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
          other codes: as returned by cnufftspread
Note: nthreads copies of the fine grid are allocated, limiting this to smaller
 problem sizes.
```

```
FINUFFT2D2
[c ier] = finufft2d2(x,y,isign,eps,f)
[c ier] = finufft2d2(x,y,isign,eps,f,opts)
Type-2 2D complex nonuniform FFT.
   c[j] = SUM f[k1,k2] exp(+/-i (k1 x[j] + k2 y[j])) for j = 1,..,nj
         k1,k2
    where sum is over -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
 Inputs:
         location of NU targets on the square [-3pi,3pi]^2, each length nj
    X, y
          size (ms, mt) complex Fourier transform value matrix
          (mode ordering given by opts.modeord in each dimension)
    isign if >=0, uses + sign in exponential, otherwise - sign.
         precision requested (>1e-16)
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
 Outputs:
         complex double array of nj answers at the targets.
    C
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
          other codes: as returned by cnufftspread
FINUFFT2D2MANY
[c ier] = finufft2d2many(x,y,isign,eps,f)
[c ier] = finufft2d2many(x,y,isign,eps,f,opts)
Type-2 2D complex nonuniform FFT.
                   f[k1, k2, d] \exp(+/-i (k1 x[j] + k2 y[j]))
  c[j,d] = SUM
           k1.k2
         for j = 1, ..., nj, d = 1, ..., ndata
    where sum is over -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
 Inputs:
    х,у
         location of NU targets on the square [-3pi,3pi]^2, each length nj
          size (ms, mt, ndata) complex Fourier transform value matrix
          (mode ordering given by opts.modeord in each dimension)
    isign if >=0, uses + sign in exponential, otherwise - sign.
          precision requested (>1e-16)
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
 Outputs:
```

```
complex double array of nj*ndata answers at the targets.
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
          other codes: as returned by cnufftspread
Note: nthreads copies of the fine grid are allocated, limiting this to smaller
problem sizes.
FINUFFT2D3
[f ier] = finufft2d3(x,y,c,isign,eps,s,t)
[f ier] = finufft2d3(x,y,c,isign,eps,s,t,opts)
             пj
    f[k] = SUM c[j] exp(+-i (s[k] x[j] + t[k] y[j])), for k = 1, ..., nk
             j=1
  Inputs:
           location of NU sources in R^2, each length nj.
    x,y
           size-nj double complex array of source strengths
    s,t frequency locations of NU targets in R^2.
    isign if >=0, uses + sign in exponential, otherwise - sign.
    eps precision requested (>1e-16)
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
  Outputs:
         size-nk double complex Fourier transform values at target
          frequencies s,t
    returned value - 0 if success, else:
                    1 : eps too small
                    2 : size of arrays to malloc exceed MAX_NF
FINUFFT3D1
[f ier] = finufft3d1(x,y,z,c,isign,eps,ms,mt,mu)
[f ier] = finufft3d1(x,y,z,c,isign,eps,ms,mt,mu,opts)
Type-1 3D complex nonuniform FFT.
    f[k1, k2, k3] =
                   SUM c[j] exp(+-i (k1 x[j] + k2 y[j] + k3 z[j]))
                     j=1
    for -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
        -mu/2 \le k3 \le (mu-1)/2.
  Inputs:
    x,y,z locations of NU sources on [-3pi,3pi]^3, each length nj
        size-nj complex array of source strengths
    isign if >=0, uses + sign in exponential, otherwise - sign.
           precision requested (>1e-16)
    ms, mt, mu number of Fourier modes requested in x, y and z; each may be
          even or odd.
          In either case the mode range is integers lying in [-m/2, (m-1)/2]
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
```

```
opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
  Outputs:
         size (ms*mt*mu) double complex array of Fourier transform values
           (ordering given by opts.modeord in each dimension, ms fastest, mu
           slowest).
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
          other codes: as returned by cnufftspread
FINUFFT3D2
[c ier] = finufft3d2(x,y,z,isign,eps,f)
[c ier] = finufft3d2(x,y,z,isign,eps,f,opts)
Type-2 3D complex nonuniform FFT.
   c[j] = SUM f[k1,k2,k3] exp(+/-i (k1 x[j] + k2 y[j] + k3 z[j]))
          k1,k2,k3
                          for j = 1, ..., nj
    where sum is over -ms/2 \le k1 \le (ms-1)/2, -mt/2 \le k2 \le (mt-1)/2,
                      -mu/2 \le k3 \le (mu-1)/2.
 Inputs:
    x,y,z location of NU targets on cube [-3pi,3pi]^3, each length nj
         size (ms, mt, mu) complex Fourier transform value matrix
          (ordering given by opts.modeord in each dimension; ms fastest to mu
          slowest).
    isign if >=0, uses + sign in exponential, otherwise - sign.
          precision requested (>1e-16)
    opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
    opts.nthreads sets requested number of threads (else automatic)
    opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
    opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
    opts.modeord: 0 (CMCL increasing mode ordering, default), 1 (FFT ordering)
    opts.chkbnds: 0 (don't check NU points valid), 1 (do, default).
    opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
 Outputs:
   С
        complex double array of nj answers at the targets.
    ier - 0 if success, else:
          1 : eps too small
          2 : size of arrays to malloc exceed MAX_NF
         other codes: as returned by cnufftspread
FINUFFT3D3
[f ier] = finufft3d3(x,y,z,c,isign,eps,s,t,u)
[f ier] = finufft3d3(x,y,z,c,isign,eps,s,t,u,opts)
             пj
    f[k] = SUM c[j] exp(+-i (s[k] x[j] + t[k] y[j] + u[k] z[j])),
             j=1
                             for k = 1, \ldots, nk
```

```
x,y,z location of NU sources in R^3, each length nj.
        size-nj double complex array of source strengths
        frequency locations of NU targets in R^3.
 isign if >=0, uses + sign in exponential, otherwise - sign.
         precision requested (>1e-16)
 opts.debug: 0 (silent, default), 1 (timing breakdown), 2 (debug info).
 opts.nthreads sets requested number of threads (else automatic)
 opts.spread_sort: 0 (don't sort NU pts), 1 (do), 2 (auto, default)
 opts.fftw: 0 (use FFTW_ESTIMATE, default), 1 (use FFTW_MEASURE)
 opts.upsampfac: either 2.0 (default), or 1.25 (low RAM, smaller FFT size)
Outputs:
        size-nk double complex Fourier transform values at target
         frequencies s,t,u
 returned value - 0 if success, else:
                   1 : eps too small
                   2 : size of arrays to malloc exceed MAX_NF
```

A note on integer sizes: In Matlab/MEX, mwrap uses int types, so that output arrays can only be <2^31. However, input arrays >=2^31 have been tested, and while they don't crash, they result in wrong answers (all zeros). This has yet to be fixed (please help; an updated version of mwrap might be needed).

For a full list of error codes see *Error codes*.

#### PYTHON INTERFACE

These python interfaces are by Daniel Foreman-Mackey, Jeremy Magland, and Alex Barnett, with help from David Stein. See the installation notes for how to install these interfaces. Below is the documentation for the nine routines. The 2d1 and 2d2 "many vector" interfaces are now also included.

#### Notes:

- 1. The module has been designed not to recompile the C++ library; rather, it links to the existing static library.
- 2. In the below, "float" and "complex" refer to double-precision for the default library. One can compile the library for single-precision, but the python interfaces are untested in this case.
- 3. NumPy input and output arrays are generally passed directly without copying, which helps efficiency in large low-accuracy problems. In 2D and 3D, copying is avoided when arrays are Fortran-ordered; hence choose this ordering in your python code if you are able (see python\_tests/accuracy\_speed\_tests.py).
- 4. Fortran-style writing of the output to a preallocated NumPy input array is used. That is, such an array is treated as a pointer into which the output is written. This avoids creation of new arrays. The python call return value is merely a status indicator.

finufftpy. $nufftldl(x, c, isign, eps, ms, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, mode-ord=0, chkbnds=1, upsampfac=2.0)$ 

1D type-1 (aka adjoint) complex nonuniform fast Fourier transform

#### **Parameters**

- **x** (float [n j]) nonuniform source points, valid only in [-3pi,3pi]
- c (complex[nj]) source strengths
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- **ms** (*int*) number of Fourier modes requested, may be even or odd; in either case the modes are integers lying in [-ms/2, (ms-1)/2]
- f (complex[ms]) output Fourier mode values. Should be initialized as a numpy array
  of the correct size
- **debug** (*int*, *optional*) 0 (silent), 1 (print timing breakdown).
- spread\_debug(int, optional) 0 (silent), 1, 2... (prints spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (do sort), 2 (heuristic decision to sort)

- fftw (int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the f array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

#### **Example**

see python\_tests/demoldl.py

finufftpy.**nufft1d2** (x, c, isign, eps, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, modeord=0, chkbnds=1, upsampfac=2.0)

1D type-2 (aka forward) complex nonuniform fast Fourier transform

```
c[j] = SUM 	 f[k1] exp(+/-i k1 x[j]) 	 for j = 0,...,nj-1 k1 where sum is over -ms/2 <= k1 <= (ms-1)/2.
```

#### **Parameters**

- **x** (float [n i]) nonuniform target points, valid only in [-3pi,3pi]
- **c** (complex[nj]) output values at targets. Should be initialized as a numpy array of the correct size
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (*float*) precision requested (>1e-16)
- **f** (complex[ms]) Fourier mode coefficients, where ms is even or odd In either case the mode indices are integers in [-ms/2, (ms-1)/2]
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug(int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw (int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the c array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

### **Example**

see python\_tests/accuracy\_speed\_tests.py

finufftpy.nufftld3 (x, c, isign, eps, s, f, debug=0,  $spread\_debug=0$ ,  $spread\_sort=2$ , fftw=0, upsampfac=2.0)

1D type-3 (NU-to-NU) complex nonuniform fast Fourier transform

### **Parameters**

- **x** (float [nj]) nonuniform source points, in R
- c (complex[nj]) source strengths
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- **s** (float [nk]) nonuniform target frequency points, in R
- **f** (complex[nk]) output values at target frequencies. Should be initialized as a numpy array of the correct size
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread debug(int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the f array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF **Return type** int

### Example

```
see python_tests/accuracy_speed_tests.py
```

finufftpy.**nufft2d1** (*x*, *y*, *c*, *isign*, *eps*, *ms*, *mt*, *f*, *debug=0*, *spread\_debug=0*, *spread\_sort=2*, *fftw=0*, *modeord=0*, *chkbnds=1*, *upsampfac=2.0*)

2D type-1 (aka adjoint) complex nonuniform fast Fourier transform

```
 \begin{array}{lll} & \text{nj-1} \\ \text{f(k1,k2)} &= & \text{SUM c[j] } \exp(+/-i \ (\text{k1 x(j)} + \text{k2 y[j]})), \\ & \text{j=0} \\ & & \text{for } -\text{ms/2} <= \text{k1} <= (\text{ms-1})/2, \ -\text{mt/2} <= \text{k2} <= (\text{mt-1})/2 \\ \end{array}
```

- **x** (float [n j]) nonuniform source x-coords, valid only in [-3pi,3pi]
- y (float [nj]) nonuniform source y-coords, valid only in [-3pi,3pi]
- c (complex[nj]) source strengths
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- ms (int) number of Fourier modes in x-direction, may be even or odd; in either case the modes are integers lying in [-ms/2, (ms-1)/2]
- mt (int) number of Fourier modes in y-direction, may be even or odd; in either case the modes are integers lying in [-mt/2, (mt-1)/2]
- **f** (complex[ms, mt]) output Fourier mode values. Should be initialized as a Fortran-ordered (ie ms fast, mt slow) numpy array of the correct size
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug (int, optional) 0 (silent), 1, 2... (prints spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the f array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

### **Example**

```
see python/tests/accuracy_speed_tests.py
```

finufftpy.nufft2d1many (x, y, c, isign, eps, ms, mt, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, modeord=0, chkbnds=1, upsampfac=2.0)

**2D type-1 (aka adjoint) complex nonuniform fast Fourier transform, for** multiple strength vectors with same nonuniform points.

```
nj-1
f(k1,k2,d) = SUM c[j,d] exp(+/-i (k1 x(j) + k2 y[j])),
j=0
for -ms/2 <= k1 <= (ms-1)/2, -mt/2 <= k2 <= (mt-1)/2,
d = 0,...,ndata-1</pre>
```

- **x** (float [nj]) nonuniform source x-coords, valid only in [-3pi,3pi]
- y (float [nj]) nonuniform source y-coords, valid only in [-3pi,3pi]
- c(complex[nj,ndata]) source strengths
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- **ms** (*int*) number of Fourier modes in x-direction, may be even or odd; in either case the modes are integers lying in [-ms/2, (ms-1)/2]
- mt (int) number of Fourier modes in y-direction, may be even or odd; in either case the
  modes are integers lying in [-mt/2, (mt-1)/2]
- **f** (complex[ms, mt, ndata]) output Fourier mode values. Should be initialized as a Fortran-ordered (ie ms fast, mt slow) numpy array of the correct size
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug(int, optional) 0 (silent), 1, 2... (prints spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The outputs are written into the f array.

For small problems this routine will be faster than repeated calls to nufft2d1.

Nthreads copies of the fine grid are allocated, limiting this to smaller problem sizes than the plain 2d1 interface.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

### **Example**

```
see python/tests/accuracy_speed_tests.py
```

finufftpy.nufft2d2 (x, y, c, isign, eps, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, mode-ord=0, chkbnds=1, upsampfac=2.0)

2D type-2 (aka forward) complex nonuniform fast Fourier transform

```
c[j] = SUM f[k1,k2] \exp(+/-i (k1 \times [j] + k2 \times [j])), for j = 0,...,nj-1 k1,k2 where sum is over -ms/2 <= k1 <= (ms-1)/2, -mt/2 <= k2 <= (mt-1)/2
```

- **x** (float [nj]) nonuniform target x-coords, valid only in [-3pi,3pi]
- **y** (float [nj]) nonuniform target y-coords, valid only in [-3pi,3pi]
- c (complex[nj]) output values at targets. Should be initialized as a numpy array of the correct size
- **isign** (int) if >=0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- **f** (complex[ms, mt]) Fourier mode coefficients, where ms and mt are either even or odd; in either case their mode range is integers lying in [-m/2, (m-1)/2], with mode ordering in all dimensions given by modeord. Ordering is Fortran-style, ie ms fastest.
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug(int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw (int, optional) 0 (use FFTW ESTIMATE), 1 (use FFTW MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the c array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

**Return type** int

### **Example**

```
see python_tests/accuracy_speed_tests.py
```

finufftpy. $nufft2d2many(x, y, c, isign, eps, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, mod-eord=0, chkbnds=1, upsampfac=2.0)$ 

**2D type-2 (aka forward) complex nonuniform fast Fourier transform, for** multiple coefficient vectors with same nonuniform points.

```
c[j,d] = SUM \quad f[k1,k2,d] \quad exp(+/-i \quad (k1 \ x[j] + k2 \ y[j])), k1,k2 for j=0,\ldots,nj-1, and d=0,\ldots,ndata-1 where sum is over -ms/2 <= k1 <= (ms-1)/2, -mt/2 <= k2 <= (mt-1)/2
```

- **x** (float [nj]) nonuniform target x-coords, valid only in [-3pi,3pi]
- y (float [nj]) nonuniform target y-coords, valid only in [-3pi,3pi]
- **c** (complex[nj, ndata]) output values at targets. Should be initialized as a Fortran-ordered numpy array of the correct size
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- **f** (complex[ms, mt, ndata]) Fourier mode coefficients, where ms and mt are either even or odd; in either case their mode range is integers lying in [-m/2, (m-1)/2], with mode ordering in all dimensions given by modeord. Ordering is Fortran-style, ie ms fastest.
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug(int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW ESTIMATE), 1 (use FFTW MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The outputs are written into the c array.

For small problems this routine will be faster than repeated calls to nufft2d2.

Nthreads copies of the fine grid are allocated, limiting this to smaller problem sizes than the plain 2d2 interface.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

### **Example**

```
see python_tests/accuracy_speed_tests.py
```

finufftpy.nufft2d3 (x, y, c, isign, eps, s, t, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, up-sampfac=2.0)

2D type-3 (NU-to-NU) complex nonuniform fast Fourier transform

```
nj-1
f[k] = SUM c[j] exp(+-i s[k] x[j] + t[k] y[j]), for k = 0,...,nk-1
<math>j=0
```

- **x** (float [nj]) nonuniform source point x-coords, in R
- y(float[nj]) nonuniform source point y-coords, in R

- c (complex[nj]) source strengths
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (*float*) precision requested (>1e-16)
- **s** (float [nk]) nonuniform target x-frequencies, in R
- t (float [nk]) nonuniform target y-frequencies, in R
- **f** (complex[nk]) output values at target frequencies. Should be initialized as a numpy array of the correct size
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug (int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the f array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF **Return type** int

### **Example**

```
see python tests/accuracy speed tests.py
```

finufftpy.nufft3d1 (x, y, z, c, isign, eps, ms, mt, mu, f, debug=0,  $spread\_debug=0$ ,  $spread\_sort=2$ , fftw=0, modeord=0, chkbnds=1, upsampfac=2.0)

3D type-1 (aka adjoint) complex nonuniform fast Fourier transform

- **x** (float [nj]) nonuniform source x-coords, valid only in [-3pi,3pi]
- **y** (float [nj]) nonuniform source y-coords, valid only in [-3pi,3pi]
- **z** (float [nj]) nonuniform source z-coords, valid only in [-3pi,3pi]
- c (complex[nj]) source strengths
- isign (int) if >=0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)
- ms (int) number of Fourier modes in x-direction, may be even or odd; in either case the modes are integers lying in [-ms/2, (ms-1)/2]

- mt (int) number of Fourier modes in y-direction, may be even or odd; in either case the modes are integers lying in [-mt/2, (mt-1)/2]
- mu (int) number of Fourier modes in z-direction, may be even or odd; in either case the
  modes are integers lying in [-mu/2, (mu-1)/2]
- **f** (complex[ms, mt, mu]) output Fourier mode values. Should be initialized as a Fortran-ordered (ie ms fastest) numpy array of the correct size
- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug(int, optional) 0 (silent), 1, 2... (prints spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the f array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

### **Example**

```
see python_tests/accuracy_speed_tests.py
```

finufftpy.nufft3d2 (x, y, z, c, isign, eps, f, debug=0,  $spread\_debug=0$ ,  $spread\_sort=2$ , fftw=0, mode-ord=0, chkbnds=1, upsampfac=2.0)

3D type-2 (aka forward) complex nonuniform fast Fourier transform

```
c[j] = SUM \quad f[k1,k2,k3] \exp(+/-i (k1 \times [j] + k2 \times [j] + k3 \times [j])). k1,k2,k3 \quad \text{for } j = 0,...,nj-1, \quad \text{where sum is over} -ms/2 <= k1 <= (ms-1)/2, \quad -mt/2 <= k2 <= (mt-1)/2, \quad -mu/2 <= k3 <= (mu-1)/2
```

- **x** (float [n j]) nonuniform target x-coords, valid only in [-3pi,3pi]
- y (float [n j]) nonuniform target y-coords, valid only in [-3pi,3pi]
- **z** (float [nj]) nonuniform target z-coords, valid only in [-3pi,3pi]
- c (complex[nj]) output values at targets. Should be initialized as a numpy array of the correct size
- isign (int) if >=0, uses + sign in exponential, otherwise sign
- **eps** (float) precision requested (>1e-16)

- **f** (complex[ms, mt, mu]) Fourier mode coefficients, where ms, mt and mu are either even or odd; in either case their mode range is integers lying in [-m/2, (m-1)/2], with mode ordering in all dimensions given by modeord. Ordering is Fortran-style, ie ms fastest.
- **debug** (*int*, *optional*) 0 (silent), 1 (print timing breakdown)
- **spread\_debug** (int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- **fftw**(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- modeord (int, optional) 0 (CMCL increasing mode ordering), 1 (FFT ordering)
- chkbnds (int, optional) 0 (don't check NU points valid), 1 (do)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the c array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF, 4 at least one NU point out of range (if chkbnds true)

Return type int

### **Example**

```
see python_tests/accuracy_speed_tests.py
```

finufftpy. $nufft3d3(x, y, z, c, isign, eps, s, t, u, f, debug=0, spread\_debug=0, spread\_sort=2, fftw=0, upsampfac=2.0)$ 

3D type-3 (NU-to-NU) complex nonuniform fast Fourier transform

- **x** (float [nj]) nonuniform source point x-coords, in R
- y (float [nj]) nonuniform source point y-coords, in R
- $\mathbf{z}$  (float [nj]) nonuniform source point z-coords, in R
- c (complex[nj]) source strengths
- isign(int) if >= 0, uses + sign in exponential, otherwise sign
- **eps** (*float*) precision requested (>1e-16)
- **s** (float [nk]) nonuniform target x-frequencies, in R
- t (float [nk]) nonuniform target y-frequencies, in R
- u (float [nk]) nonuniform target z-frequencies, in R
- **f** (complex[nk]) output values at target frequencies. Should be initialized as a numpy array of the correct size

- **debug** (int, optional) 0 (silent), 1 (print timing breakdown)
- spread\_debug(int, optional) 0 (silent), 1, 2... (print spreader info)
- **spread\_sort** (*int*, *optional*) 0 (don't sort NU pts in spreader), 1 (sort), 2 (heuristic decision to sort)
- fftw(int, optional) 0 (use FFTW\_ESTIMATE), 1 (use FFTW\_MEASURE)
- upsampfac (float) either 2.0 (default), or 1.25 (low RAM & small FFT size)

**Note:** The output is written into the f array.

**Returns** 0 if success, 1 if eps too small, 2 if size of arrays to malloc exceed MAX\_NF **Return type** int

### **Example**

see python\_tests/accuracy\_speed\_tests.py

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# **EIGHT**

# **JULIA INTERFACE**

Ludvig af Klinteberg has built an interface from the julia language. This interface is found at this github repo, and is actually a secondary wrapper around our python interface, so you should make sure that the latter is working first.

**CHAPTER** 

**NINE** 

# **RELATED PACKAGES**

# Interfaces to FINUFFT from other languages

• FINUFFT.jl: a julia language wrapper by Ludvig af Klinteberg (SFU). This is actually a secondary wrapper around our python interface, so you should make sure that the latter is working first.

# Packages making use of FINUFFT

Here are some packages making use of FINUFFT (please let us know others):

• sinctransform: C++ and MATLAB codes to evaluate sums of the sinc and sinc^2 kernels between arbitrary nonuniform points in 1,2, or 3 dimensions, by Hannah Lawrence (2017 summer intern at Flatiron).

**CHAPTER** 

**TEN** 

## **KNOWN ISSUES**

One should also check the github issues for the project page, https://github.com/ahbarnett/finufft/issues Also see notes in the TODO file.

# **Issues with library**

- When requested accuracy is 1e-14 or less, it is sometimes not possible to match this, especially when there are a large number of input and/or output points. This is believed to be unavoidable round-off error.
- Currently in Mac OSX, make lib fails to make the shared object library (.so).
- The timing of the first FFTW call is complicated, depending on whether FFTW\_ESTIMATE (the default) or FFTW\_MEASURE is used. Such issues are known, and discussed in other documentation, eg https://pythonhosted.org/poppy/fft\_optimization.html We would like to find a way of pre-storing some Intelspecific FFTW plans (as MATLAB does) to avoid the large FFTW\_ESTIMATE planning time.
- Currently, a single library name is used for single- and multi-threaded versions. Thus, i) you need to make clean before changing such make options, and ii) if you wish to maintain multiple such versions you need to move them around and maintain them yourself, eg by duplicating the directory.

## **Issues with interfaces**

- MATLAB, octave and python cannot exceed input or output data sizes of 2^31.
- MATLAB, octave and python interfaces do not handle single precision.
- A segfault occurs a small fft is done in MATLAB before the first finufft call in a session. We believe this
  due to incompatibility between the versions of FFTW used. We have fixed this by building a certain fft call
  into the MEX interface. A similar hack has been used by NFFT for the last decade. This issue does not occur
  with octave.

# **Bug reports**

If you think you have found a bug, please file an issue on the github project page, https://github.com/ahbarnett/finufft/issues Include a minimal code which reproduces the bug, along with details about your machine, operating system, compiler, and version of FINUFFT.

You may also contact Alex Barnett (abarnett at-sign flatironinstitute.org) with FINUFFT in the subject line.

## **ELEVEN**

## **ACKNOWLEDGMENTS**

The main code and mathematical development is by:

- Alex Barnett (Flatiron Institute)
- Jeremy Magland (Flatiron Institute)

Significant SIMD vectorization/acceleration of the spreader by:

• Ludvig af Klinteberg (SFU)

Other code contributions:

- Yu-Hsuan ("Melody") Shih 2d1many, 2d2many interface for many vectors same points
- Leslie Greengard and June-Yub Lee CMCL fortran drivers and test codes
- Dan Foreman-Mackey python wrappers
- David Stein python wrappers
- Dylan Simon sphinx help

### Testing, bug reports:

- Joakim Anden catching memory leak, Matlab/FFTW issues, performance tests
- Hannah Lawrence user testing and finding bugs
- Marina Spivak fortran testing
- Hugo Strand python bugs

### Helpful discussions:

- Charlie Epstein analysis of kernel Fourier transform sums
- Christian Muller optimization (CMA-ES) for early kernel design
- Andras Pataki complex number speed in C++
- Timo Heister pass/fail numdiff testing ideas
- Zydrunas Gimbutas explanation that NFFT uses Kaiser-Bessel backwards
- Vladimir Rokhlin piecewise polynomial approximation on complex boxes

**CHAPTER** 

## **TWELVE**

## **REFERENCES**

References for this software and the underlying mathematics include:

[FIN] A parallel non-uniform fast Fourier transform library based on an "exponential of semicircle" kernel. A. H. Barnett, J. F. Magland, and L. af Klinteberg. Preprint (2018).

[ORZ] Prolate Spheroidal Wave Functions of Order Zero: Mathematical Tools for Bandlimited Approximation. A. Osipov, V. Rokhlin, and H. Xiao. Springer (2013).

[KK] Chapter 7. System Analysis By Digital Computer. F. Kuo and J. F. Kaiser. Wiley (1967).

[FS] Nonuniform fast Fourier transforms using min-max interpolation. J. A. Fessler and B. P. Sutton. IEEE Trans. Sig. Proc., 51(2):560-74, (Feb. 2003)

[KKP] Using NFFT3—a software library for various nonequispaced fast Fourier transforms. J. Keiner, S. Kunis and D. Potts. Trans. Math. Software 36(4) (2009).

[F] Non-equispaced fast Fourier transforms with applications to tomography. K. Fourmont. J. Fourier Anal. Appl. 9(5) 431-450 (2003).

This code builds upon the CMCL NUFFT, and the Fortran wrappers are very similar to its interfaces. For that the following are references:

[GL] Accelerating the Nonuniform Fast Fourier Transform. L. Greengard and J.-Y. Lee. SIAM Review 46, 443 (2004).

[LG] The type 3 nonuniform FFT and its applications. J.-Y. Lee and L. Greengard. J. Comput. Phys. 206, 1 (2005).

The original NUFFT analysis using truncated Gaussians is:

[DR] Fast Fourier Transforms for Nonequispaced data. A. Dutt and V. Rokhlin. SIAM J. Sci. Comput. 14, 1368 (1993).

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